



NA-MIC

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Stochastic Tractography

Analysis of the uncinate fasciculus

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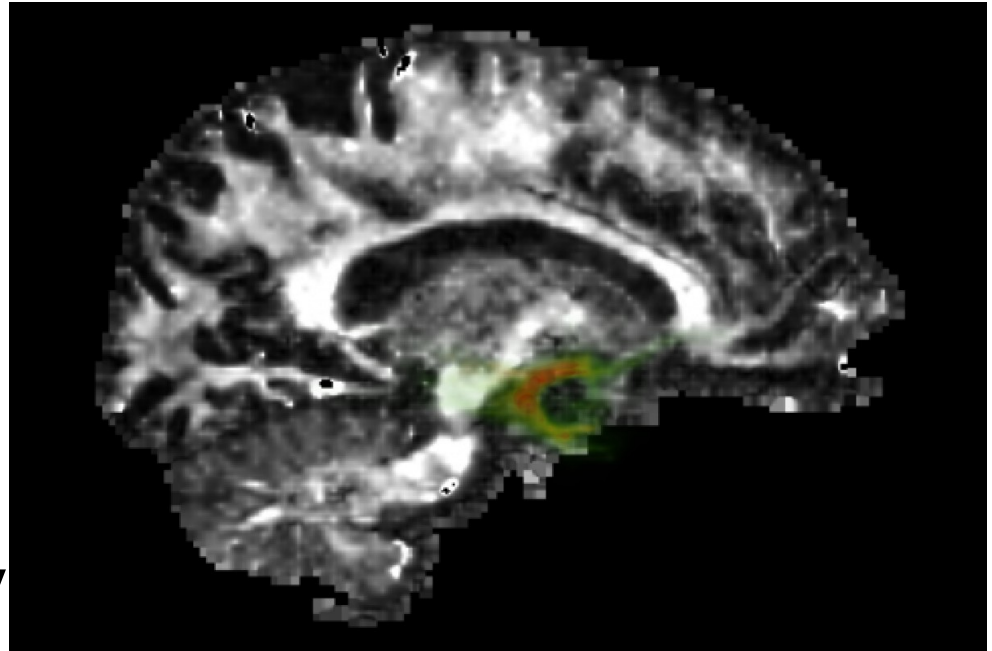
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Learning Objective

This tutorial will lead you through a Fractional Anisotropy analysis of the uncinate fasciculus to illustrate using the stochastic tractography module in Slicer 3.6



Visualized stochastic cloud of the uncinate fasciculus



Pre-requisite

To use this tutorial, you should already know how to load images, create ROI labelmaps, and do basic work with diffusion MRI images.

See especially the Visualization tutorial and the Diffusion tutorial by Sonia Pujol:

http://www.slicer.org/slicerWiki/images/6/67/Slicer3Course_DataLoading_3DVisualization_SoniaPujol.pdf

http://www.slicer.org/slicerWiki/images/2/20/DiffusionMRITutorial_SF2009_SPujol.pdf



Material

- This tutorial requires the installation of the **Slicer3.6 release** and the tutorial dataset. They are available at the following locations:

- **Slicer3.6** download page

<http://www.slicer.org/pages/Downloads/>

- **Tutorial dataset:** stochastic_tutorial_data.zip

[\[http://www.na-mic.org/Wiki/images/e/e7/Stochastic_tutorial_data.zip\]](http://www.na-mic.org/Wiki/images/e/e7/Stochastic_tutorial_data.zip)

Disclaimer: *It is the responsibility of the user of Slicer to comply with both the terms of the license and with the applicable laws, regulations, and rules.*



Platform

This tutorial was developed on a 64-bit Linux operating system. It has been tested on no other systems at this time.



Overview

1. Discussion
2. Set up Slicer
3. Running stochastic tractography
4. Visualizing results
5. Analyzing results
6. Conclusion



How it works

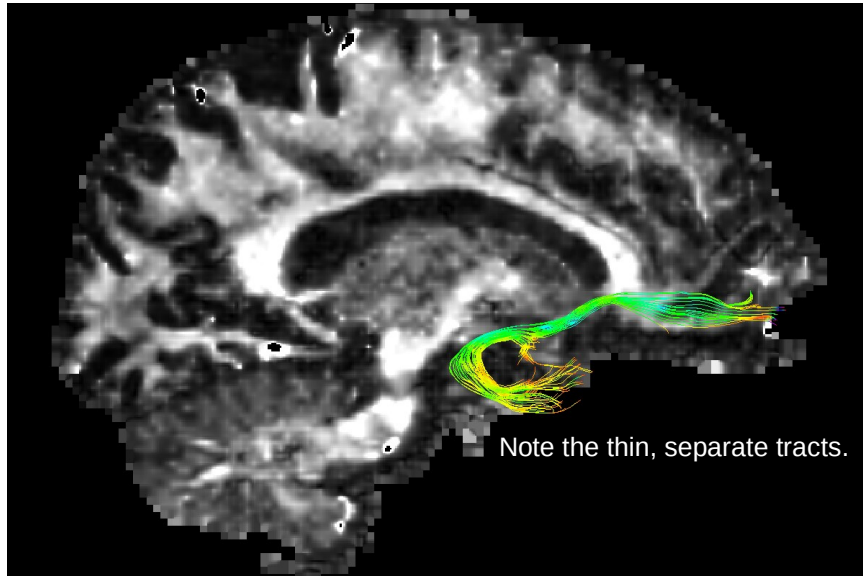
Stochastic tractography finds the probability of connection between a seeding region and another point

This is done by calculating streamline tracts with a small amount of variation introduced at each step. These tracts are then averaged to produce a “stochastic cloud”



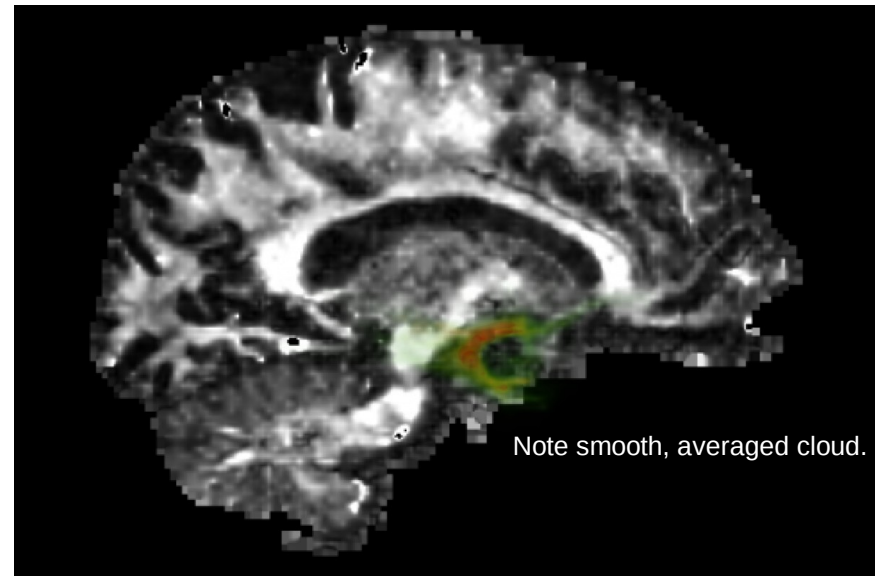
How it works

Streamline tractography of the uncinate.



Stochastic shows the “probability” of connection, allowing weighted analysis of measures in the cloud.

Streamline shows direct connections between regions, allowing fiber based analysis of measures or analysis of voxels within the tract’s path.



Stochastic tractography of the uncinate.



Setting up

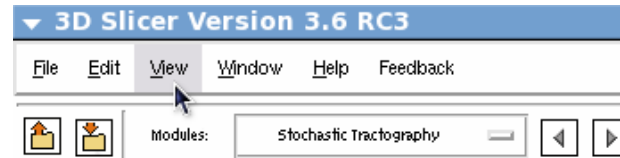
The Stochastic Tractography module feeds data to python, where it does all its processing. You need to enable this by checking “Enable Slicer Daemon” in Slicer’s settings.

The screenshot displays the Slicer software interface with several settings panels. The 'IO' panel shows 'Input DWI Volume', 'Input ROI Volume (Region A)', 'Input ROI Volume (Region B)', and 'Input WM Volume' all set to 'None'. The 'Smoothing' panel has 'Gaussian FWHM' set to '1.0,1.0,1.0' and 'Enabled' checked. The 'Brain Mask' panel has 'Lower Brain threshold' set to '400' and 'Higher Brain threshold' set to '1000'. The 'IJK/RAS Switch' and 'Diffusion Tensor' panels are also visible. A terminal window is overlaid on the bottom right, showing a log of messages from the Slicer3.6-RC3/Slicer3 start_scene.mrmL process. The log includes 'Launching pipeline server', 'conn_made: client_address=', 'param id: pipeline', 'param value: ['STOCHASTIC']', 'param id: dwi', 'param value: ['01053-dwi-filt-Ed']', 'param id: roiA', 'param value: ['rh-ROI A']', 'param id: roiB', 'param value: ['rh-ROI B']', 'param id: smoothEnabled', 'param value: ['1']', 'param id: stdDev', 'param value: 1.2;1.2;1.2', 'param id: wmEnabled', 'param value: ['1']', 'param id: infWMThres', 'param value: ['250']', 'param id: supWMThres', 'param value: ['6000']', 'param id: isIJK', 'param value: ['1']', 'param id: tensEnabled', 'param value: ['0']', 'param id: bline', 'param value: ['0']', 'param id: faEnabled', 'param value: ['0']', 'param id: traceEnabled', 'param value: ['0']', 'param id: modeEnabled', 'param value: ['0']', 'param id: stEnabled', 'param value: ['1']'. An arrow points from the 'Enable Slicer Daemon' text to the terminal window.

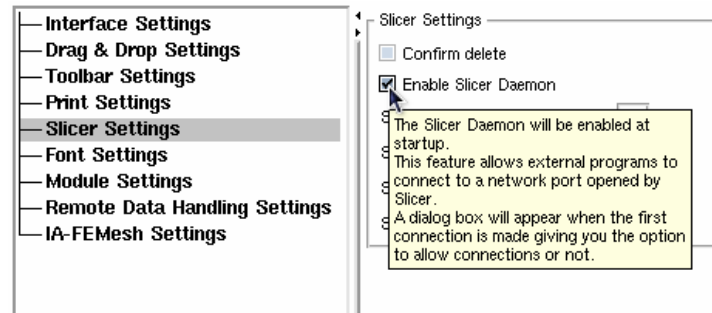


Setting up

- Go to “View” -> “Application Settings”



- Select “Slicer Settings” then
- Check “Enable Slicer Daemon”



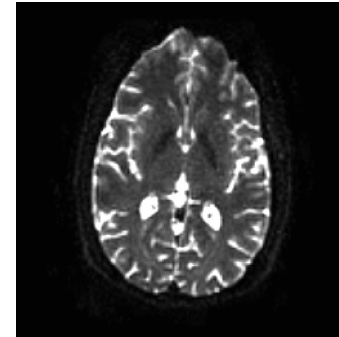
- Now restart Slicer3
- This step only needs to be completed once



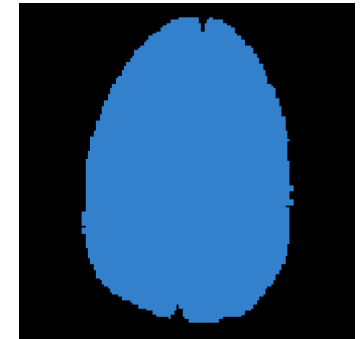
Setting up

Load the images in the dataset

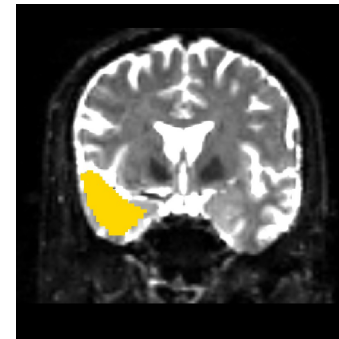
- DWI: A filtered and eddy current corrected diffusion weighted MRI
- Mask: from Diffusion Tensor Estimation module
- ROIA: labelmap slice of uncinate
- ROIB: labelmap slice of uncinate



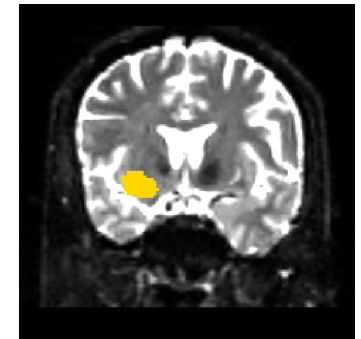
DWI (baseline shown)



Mask from Estimation module



ROI A (shown over baseline)



ROI B (shown over baseline)



Run Tractography

It is now time to start Stochastic Tractography.

You will find the module in:
Modules ->
Diffusion ->
Tractography ->
Stochastic Tractography

There are a number of inputs and optional commands for the module. In the following slides we will cover which options to choose.

The screenshot displays the configuration window for Stochastic Tractography, organized into several sections:

- IO:** Input DWI Volume (None), Input ROI Volume (Region A) (None), Input ROI Volume (Region B) (None), Input WM Volume (None).
- Smoothing:** Enabled (checkbox), Gaussian FWHM (1, 0, 1, 0, 1, 0).
- Brain Mask:** Enabled (checkbox), Lower Brain threshold (400), Higher Brain threshold (1000).
- UKRAS Switch:** UK Based (checked checkbox).
- Diffusion Tensor:** Enabled (checkbox), FA (checkbox), TRACE (checkbox), MODE (checkbox).
- Tractography:** Enabled (checked checkbox), Total tracts (100), Maximum tract length (200), Step size(mm) (0.5), Use spacing (checkbox), Stopping criteria (checkbox), FA (0), Use basic method (checked checkbox).
- Connectivity Map:** Computation Mode (binary, cumulative, weighted), Length Based (checkbox), Length Class (small, medium, large), Threshold (0.1), Tract offset (0), Use spherical ROI vicinity (checkbox), Vicinity (0).
- Automatic Server Initialisation:** Enabled (checked checkbox).

Buttons at the bottom: Default, Cancel, Apply.



Run Tractography

IO

Input DWI Volume None

Input ROI Volume (Region A) None

Input ROI Volume (Region B) None

Input WM Volume None

Here you pick the DWI image to use as well as the seeding and filtering ROIs, and a white matter volume to mask the tensor volume before tractography.

IO tab:

- Input DWI Volume: DWI.nhdr
- Input ROI Volume (Region A): ROIA.nhdr
- Input ROI Volume (Region B): ROIB.nhdr
- Input WM Volume: mask.nhdr



Run Tractography



Here you will decide how to smooth the DWI image before estimating tensors. This will help to remove noise and improve the tracking algorithm.

Smoothing tab:

- Enabled: check
- Gaussian FWHM: “1.2,1.2,1.2”



Run Tractography

Brain Mask

Enabled

Lower Brain threshold 400

Higher Brain threshold 1000

Here you will decide threshold values for the brain mask, if you are using a B0 baseline image to do the masking instead of a supplied WM Volume.

Brain Mask tab:

- Enabled: do not check.
- Lower Brain threshold: N/A
- Higher Brain Threshold: N/A



Run Tractography



Here you supply whether your imaging is based on IJK coordinates or RAS.

IJK/RAS switch tab:
– Enabled: check



Run Tractography



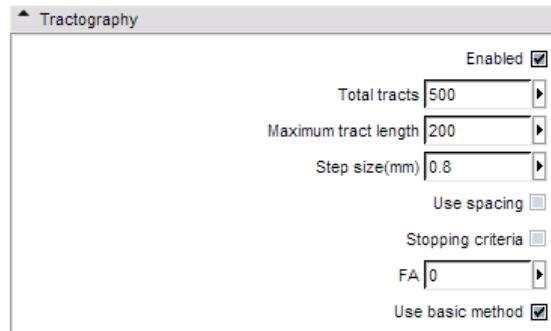
Here you choose which diffusion measures you would like Slicer to calculate as it performs tractography

Diffusion Tensor tab:

- Enabled: check
- FA: check
- TRACE: do not check
- MODE: do not check



Run Tractography



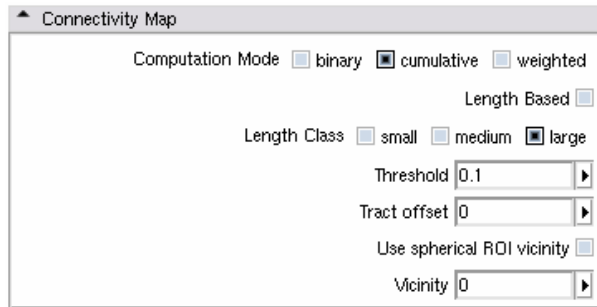
Tractography tab:

- Enabled: check
- Total Tracts: 500
- Maximum tract length: 200
- Step Size (mm): 0.8
- Use spacing: do not check
- Stopping criteria: do not check
- FA: N/A
- Use basic method: check

Here you set the parameters of stochastic tractography, total tracts means seed tracts per voxel, Max tract length cuts off fibers longer than value, step size is distance between tensor recalculation. We don't use spacing or stopping criteria, and "basic method" refers to using the Friman algorithm for stochastic tractography.



Run Tractography



Connectivity Map tab:

- Computation Mode: cumulative
- Length Based: N/A
- Length Class: N/A
- Threshold: N/A
- Tract offset: N/A

Here you set parameters for the creation of the connectivity map. Cumulative adds each tract passing through a voxel, length based removes tracts based on their size category, threshold sets a minimum probability threshold for showing, tract offset enlarges the target ROI, Use Spherical ROI vicinity creates a spherical target ROI, with size set by Vicinity.

- Use spherical ROI vicinity: N/A
- Vicinity: N/A



Run Tractography



Here you enable the automatic start of the python server that does the processing.

Automatic Server Initialisation tab:

– Enabled: check



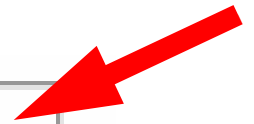
Run Tractography

Hit “Apply” to begin tractography

Default

Cancel

Apply



A dialog prompting you to
“allow incoming connections?”
will appear. Select OK.



Run Tractography

Data will now be sent to the python program, and you can watch the progress in the command line terminal.

Completing the program takes a long time – on a 2.3GHz computer with 8GB RAM it runs for ~24 hrs.

```
Terminal
File Edit View Terminal Help

[1] Done                               Slicer3.6-RC3/Slicer3 start_scene.mrml
1276121587.69 690 INFO 140358946608880 __main__ Launching pipeline server
1276121589.48 476 INFO 140358946608880 __main__ conn_made: client_address=
127.0.0.1:46745
1276121589.48 477 INFO 140358946608880 __main__ param id: pipeline
1276121589.48 477 INFO 140358946608880 __main__ param value: ['STOCHASTIC'
]
1276121589.48 477 INFO 140358946608880 __main__ param id: dwi
1276121589.48 477 INFO 140358946608880 __main__ param value: ['01053-dwi-f
ilt-Ed']
1276121589.48 477 INFO 140358946608880 __main__ param id: roiA
1276121589.48 477 INFO 140358946608880 __main__ param value: ['rh-ROIA']
1276121589.48 478 INFO 140358946608880 __main__ param id: roiB
1276121589.48 478 INFO 140358946608880 __main__ param value: ['rh-ROIB']
1276121589.48 478 INFO 140358946608880 __main__ param id: smoothEnabled
1276121589.48 478 INFO 140358946608880 __main__ param value: ['1']
1276121589.48 478 INFO 140358946608880 __main__ param id: stdDev
1276121589.48 478 INFO 140358946608880 __main__ param value: 1.2:1.2:1.2
1276121589.48 478 INFO 140358946608880 __main__ param id: wmEnabled
1276121589.48 479 INFO 140358946608880 __main__ param value: ['1']
1276121589.48 479 INFO 140358946608880 __main__ param id: infWMThres
1276121589.48 479 INFO 140358946608880 __main__ param value: ['250']
1276121589.48 479 INFO 140358946608880 __main__ param id: supWMThres
1276121589.48 479 INFO 140358946608880 __main__ param value: ['6000']
1276121589.48 479 INFO 140358946608880 __main__ param id: isIJK
1276121589.48 479 INFO 140358946608880 __main__ param value: ['1']
1276121589.48 480 INFO 140358946608880 __main__ param id: tensEnabled
1276121589.48 480 INFO 140358946608880 __main__ param value: ['0']
1276121589.48 480 INFO 140358946608880 __main__ param id: faEnabled
1276121589.48 480 INFO 140358946608880 __main__ param value: ['0']
1276121589.48 480 INFO 140358946608880 __main__ param id: traceEnabled
1276121589.48 481 INFO 140358946608880 __main__ param value: ['0']
1276121589.48 481 INFO 140358946608880 __main__ param id: modeEnabled
1276121589.48 481 INFO 140358946608880 __main__ param value: ['0']
1276121589.48 481 INFO 140358946608880 __main__ param id: stEnabled
1276121589.48 481 INFO 140358946608880 __main__ param value: ['1']
```

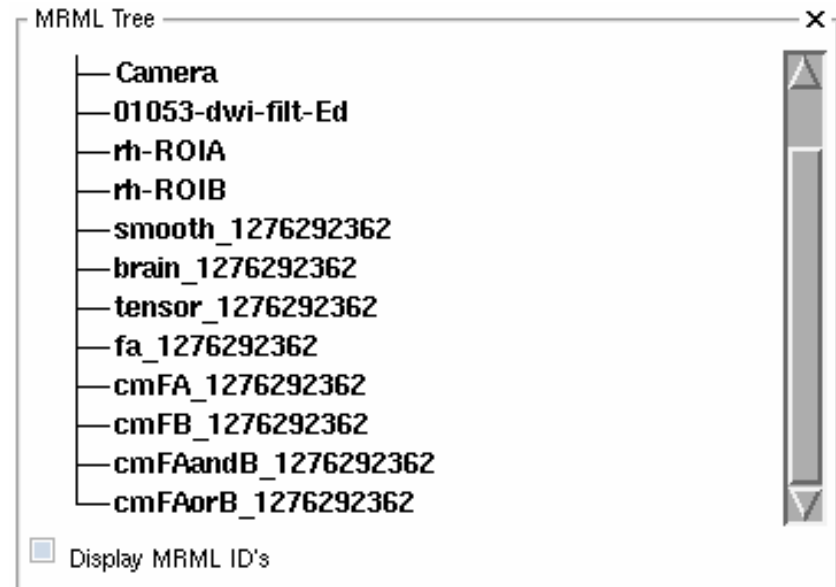


Stochastic Output

You will know the program has finished when the results appear in the scene. You can see by going to “Module” -> “Data.”

The following volumes appear when complete:

- smooth
- brain
- tensor
- fa
- cmFA
- cmFB
- cmFAandB
- cmFAorB

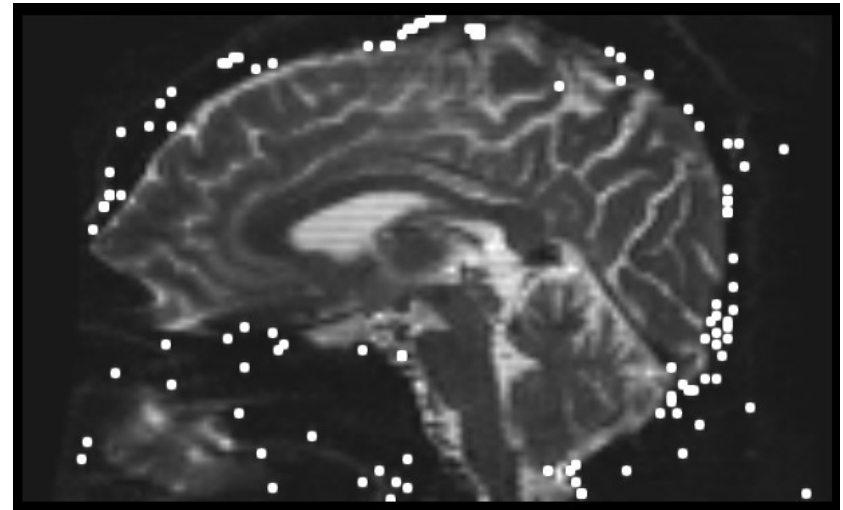




Stochastic Output

Smooth

- If you enabled smoothing, this volume shows the results on a B0-baseline image.





Stochastic Output

Brain

- This image shows the mask used. If you selected a WM Volume, this is it, if you set threshold values in the brain mask tab, this is the resulting brain mask.

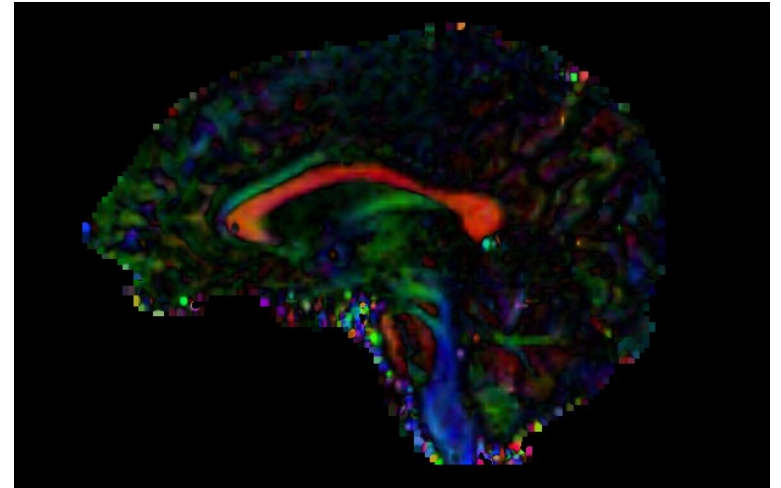




Stochastic Output

Tensor

- This is a tensor volume, estimated from a smoothed version of the DWI you provided. Here it is represented with a color by orientation map.

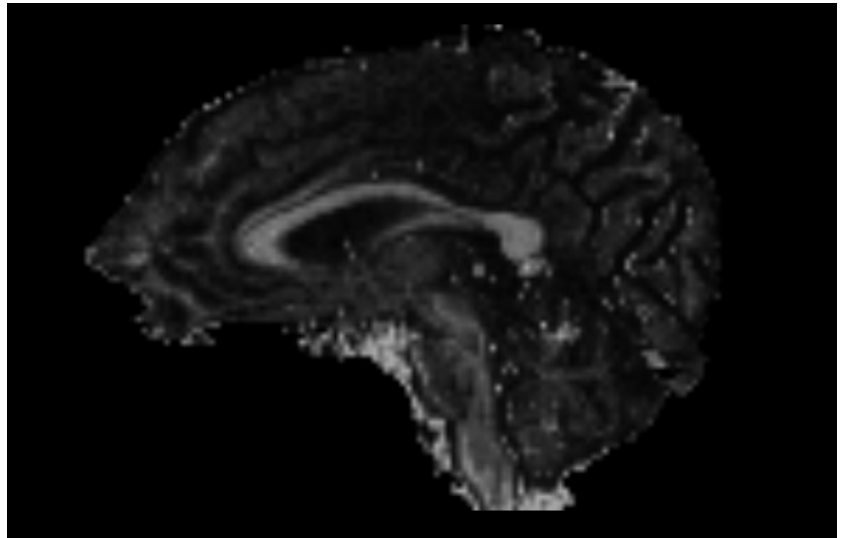




Stochastic Output

FA

- This is fractional anisotropy volume, calculated from the tensor volume, above.





Stochastic Output

cmFA

- This is a normalized connectivity map showing the probability of a voxel's connection to region A.

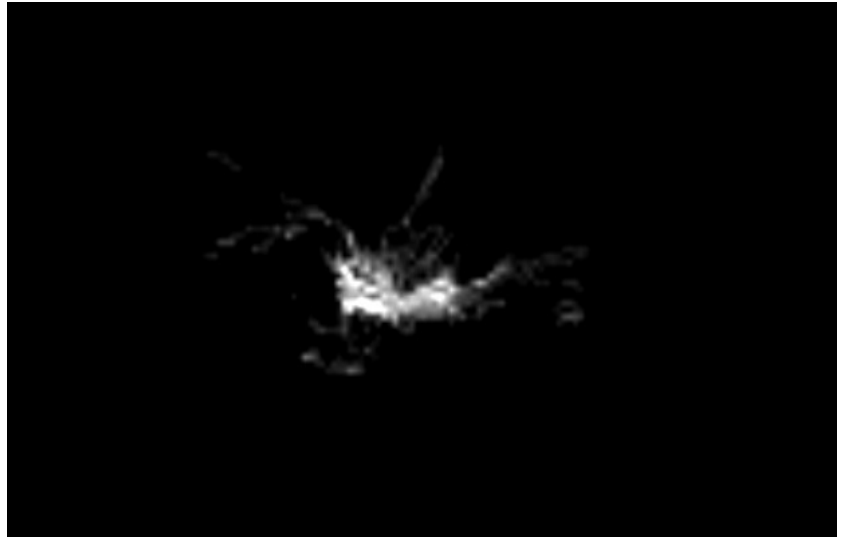




Stochastic Output

cmFB

- This is a normalized connectivity map showing the probability of a voxel's connection to region B.





Stochastic Output

cmFAandB

- This is a normalized connectivity map showing the intersection of the cmFA and cmFB maps.

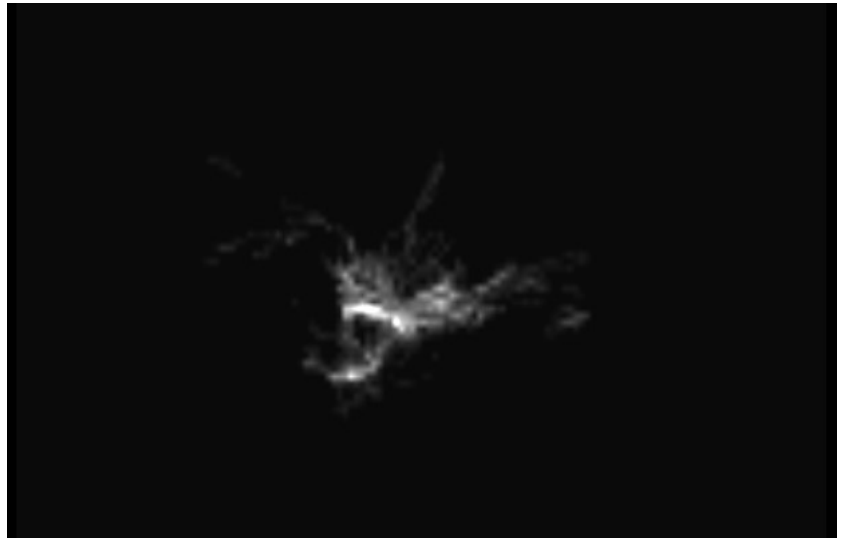




Stochastic Output

cmFAorB

- This is a normalized connectivity map showing the union of the cmFA and cmFB maps.





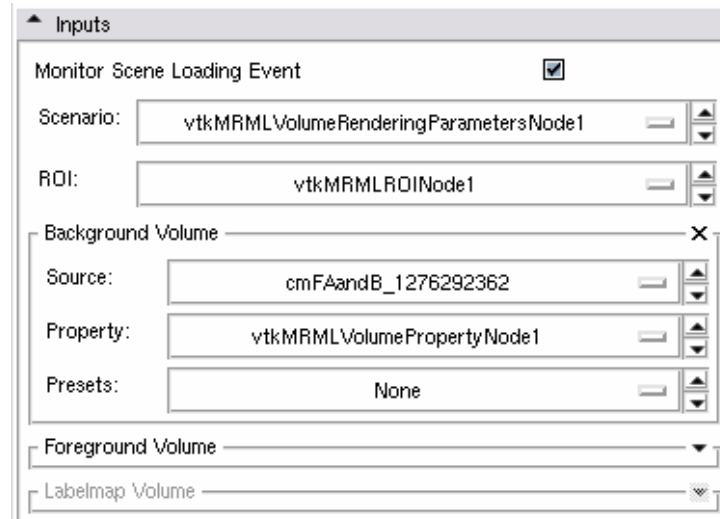
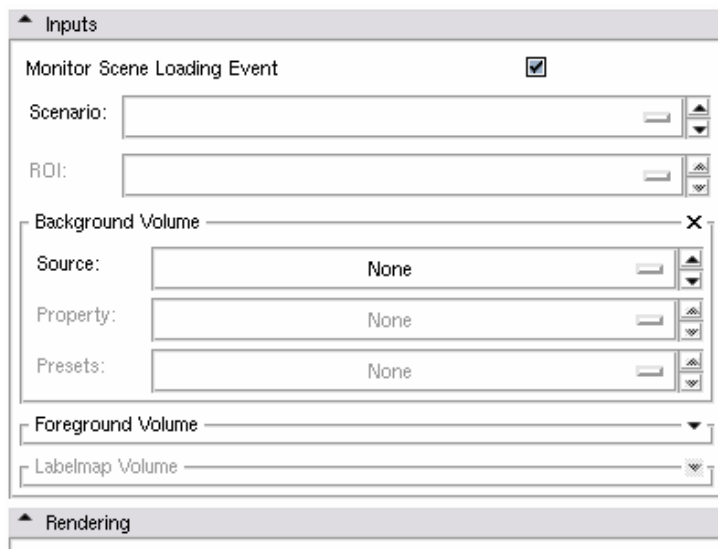
Visualize

An easy way to visualize the stochastic cloud is through the “Volume Rendering” module – this will create a 3D model where opacity values of the cloud are assigned based on the probability. Higher probability means a denser cloud.



Visualize

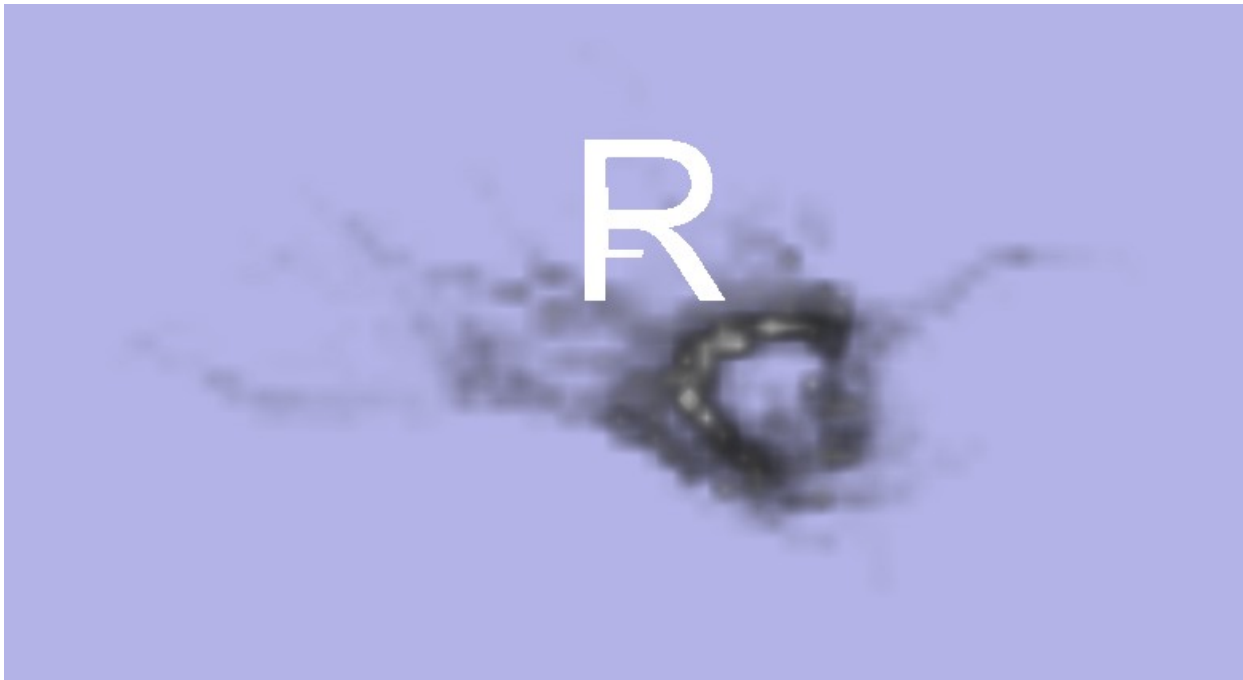
Under “Source” select
“cmFAandB_somenumber”
“Scenario,” “ROI,” and “Property” will
all automatically populate.





Visualize

The 3D model will appear in the 3D viewing window.
From here you can adjust the background images shown
as described in the basic tutorial.





Analyze

As an example for the analysis of stochastic tractography results, we will count the mean FA covered by the tracts.

We will first find all tracts with a greater than 10% chance of connection.

Then we will weight the FA map by the probability of connection

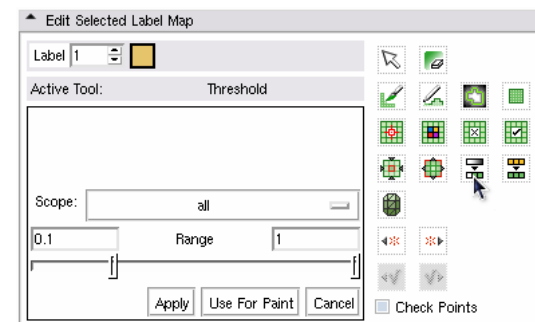
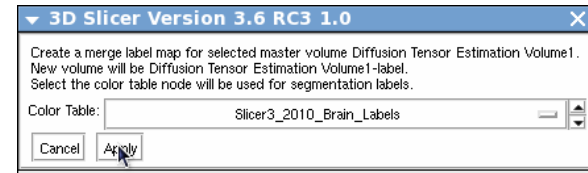
Finally, we will find the mean FA by use of the Label Statistics module.



Analyze

Threshold:

- Select cmFAandB in “Background” of one slice window
- Go to “Modules” -> “Editor”
- A window asking for your label map selection will appear. Hit “OK”
- Select the “Threshold” button
- Change the threshold to 0.1-1
- Hit “Apply”
- Every voxel in cmFAandB that was above 0.1 should now be colored in on the labelmap, cmFAandB_#####-label





Analyze

To create a weighted FA volume for analysis, go to:
“Modules” -> “Filtering” -> “Arithmetic” -> “Multiply images”

IO Tab:

Input Volume 1: fa

Input Volume 2: cmFAandB

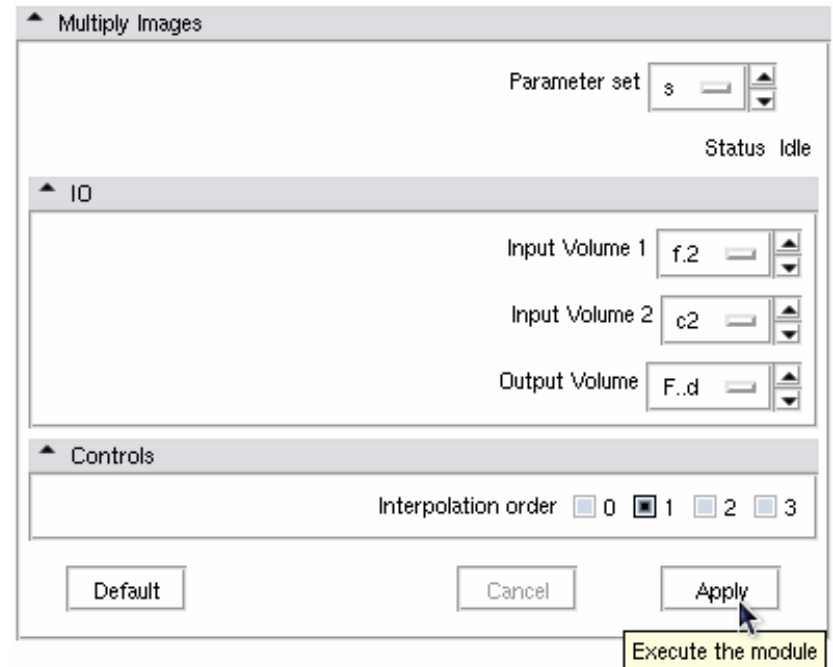
Output Volume: Create New Volume

Then, under Output Volume, select Rename and rename the volume “FA_multiplied”

Controls Tab:

Interpolation order: 1

Hit Apply





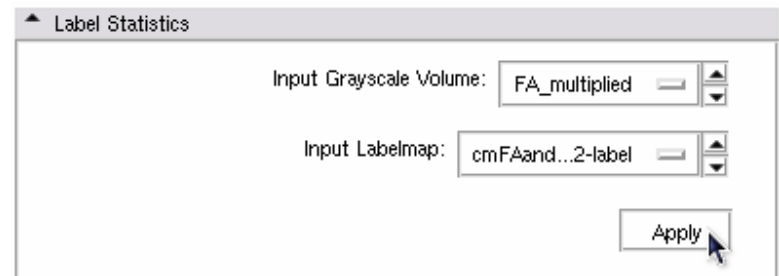
Analyze

To get results, we will go to:
“Modules” -> “Quantification” -> “Label
Statistics”

Input Grayscale Volume: FA_multiplied
Input Labelmap: cmFAandB_#####-label

Hit Apply.

The results will appear in the spreadsheet
below. Scroll to the right to see the average
and standard deviation for FA under label 1 –
all the voxels with a probability of over 0.1
You can save the results to a text document
for further analysis with “Save to File”



mm ³)	Min	Max	Mean	StdDev
264873	0.000000	0.053517	0.000005	0.000268
456	0.004396	0.363702	0.064012	0.050340



Conclude

We have now seen the complete process of running stochastic tractography from setting up Slicer to running stochastic tractography, to visualizing the results, and finally analyzing the outputs.



Acknowledgments



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**Psychiatry Neuroimaging Laboratory of Brigham
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